

# **Analysis of Factors Affecting Activity of Non-Precious Metal ORR Catalysts for PEM Fuel Cells**

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## **Abstract**

Fuel cells are currently the focus of much interest and research. They are also an integral part of the Hydrogen Economy and show much potential for environmentally-friendly mobile and stationary power generation. Of the types of fuel cells, the proton exchange membrane fuel cell (PEMFC) has shown traits desirable for vehicular application including short start-up times and lower operating temperatures. One of the major hindrances to commercialization of PEMFCs is that platinum is used for the cathode. This is an issue because of platinum's limited availability and cost, both of which would not work well with economies of scale. These limitations have encouraged research into non-precious metal catalysts (NPMC) for PEMFCs.

This project was concerned with the development of NPMC for PEMFCs and was focused on improving catalytic activity so that NPMCs can operate comparably to platinum. Several NPMCs were synthesized for this project. The multistep-preparation process began with wetness impregnation followed by ballmilling, heat treatment in an inert gas, and ended with heat treatment in a reactive gas. The effects of varying the non-precious metal precursor used in wetness impregnation, inert gas, reactive gas, and reactive-gas heat-treatment duration will be explored. Electrochemical experiments to determine the activity of these catalysts were completed, and it was found that the second heat treatment improved catalytic activity. Statistical analysis will also be used to qualitatively determine the influence of preparation parameters on catalytic performance.

This project aimed to examine the feasibility of using statistical modeling for estimation of the influence of preparation parameters on catalytic activity of NPMC towards the ORR with the long-term goal of optimization of catalytic activity and eventual marketability of NPMC catalysts.

## **Dedication**

To my family and friends who have put up with not seeing me for long stretches of time so that I could complete this work and my undergraduate education.

To Dr. Matthew Stoltzfus who inspired me to pursue research.

To Jesus Christ for giving me life and truth.

## Acknowledgements

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## Introduction

Fuel cells are currently the focus of much interest and research. They are also an integral part of the Hydrogen Economy and show much potential for environmentally-friendly mobile and stationary power generation.

There are five main types of fuel cells, each named after the electrolyte it uses: proton exchange (or polymer electrolyte) membrane (PEM), alkaline, phosphoric acid, molten carbonate, and solid oxide. PEM fuel cells (PEMFC) use a polymeric membrane that conducts protons, normally Nafion. Alkaline fuel cells (AFC) use basic solution, typically potassium hydroxide. Phosphoric acid fuel cells (PAFC) use phosphoric acid in a matrix. Molten carbonate fuel cells (MCFC) use a molten metal (lithium, sodium, magnesium) carbonate. Solid oxide fuel cells (SOFC) use yttria-stabilized zirconia.<sup>1, 2</sup>

Figure 1 gives an overview of these fuel cells.

**Comparison of Fuel Cell Technologies**

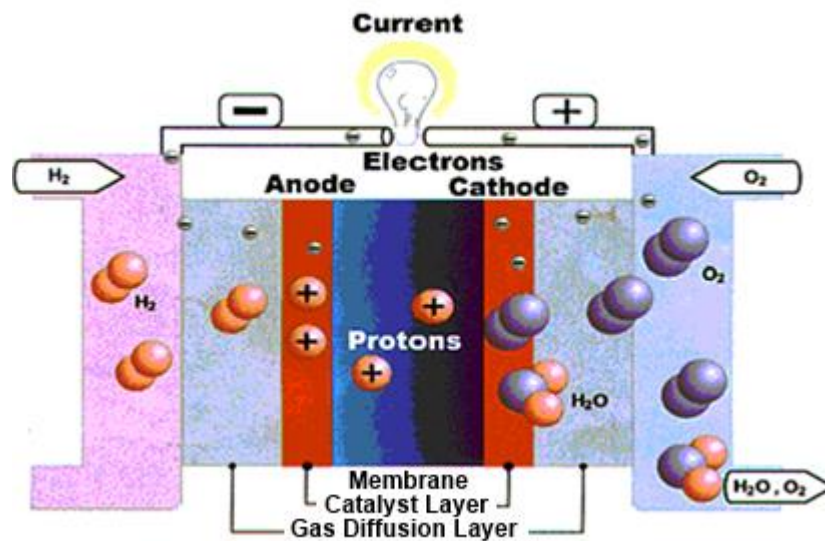
Fuel Cell Type	Common Electrolyte	Operating Temperature	Typical Stack Size	Efficiency	Applications	Advantages	Disadvantages
<b>Polymer Electrolyte Membrane (PEM)</b>	Perfluoro sulfonic acid	50-100°C 122-212° typically 80°C	< 1kW-100kW	60% transportation 35% stationary	<ul style="list-style-type: none"> <li>Backup power</li> <li>Portable power</li> <li>Distributed generation</li> <li>Transportation</li> <li>Specialty vehicles</li> </ul>	<ul style="list-style-type: none"> <li>Solid electrolyte reduces corrosion &amp; electrolyte management problems</li> <li>Low temperature</li> <li>Quick start-up</li> </ul>	<ul style="list-style-type: none"> <li>Expensive catalysts</li> <li>Sensitive to fuel impurities</li> <li>Low temperature waste heat</li> </ul>
<b>Alkaline (AFC)</b>	Aqueous solution of potassium hydroxide soaked in a matrix	90-100°C 194-212°F	10-100 kW	60%	<ul style="list-style-type: none"> <li>Military</li> <li>Space</li> </ul>	<ul style="list-style-type: none"> <li>Cathode reaction faster in alkaline electrolyte, leads to high performance</li> <li>Low cost components</li> </ul>	<ul style="list-style-type: none"> <li>Sensitive to CO<sub>2</sub> in fuel and air</li> <li>Electrolyte management</li> </ul>
<b>Phosphoric Acid (PAFC)</b>	Phosphoric acid soaked in a matrix	150-200°C 302-392°F	400 kW 100 kW module	40%	<ul style="list-style-type: none"> <li>Distributed generation</li> </ul>	<ul style="list-style-type: none"> <li>Higher temperature enables CHP</li> <li>Increased tolerance to fuel impurities</li> </ul>	<ul style="list-style-type: none"> <li>Pt catalyst</li> <li>Long start up time</li> <li>Low current and power</li> </ul>
<b>Molten Carbonate (MCFC)</b>	Solution of lithium, sodium, and/or potassium carbonates, soaked in a matrix	600-700°C 1112-1292°F	300 kW-3 MW 300 kW module	45-50%	<ul style="list-style-type: none"> <li>Electric utility</li> <li>Distributed generation</li> </ul>	<ul style="list-style-type: none"> <li>High efficiency</li> <li>Fuel flexibility</li> <li>Can use a variety of catalysts</li> <li>Suitable for CHP</li> </ul>	<ul style="list-style-type: none"> <li>High temperature corrosion and breakdown of cell components</li> <li>Long start up time</li> <li>Low power density</li> </ul>
<b>Solid Oxide (SOFC)</b>	Yttria stabilized zirconia	700-1000°C 1202-1832°F	1 kW-2 MW	60%	<ul style="list-style-type: none"> <li>Auxiliary power</li> <li>Electric utility</li> <li>Distributed generation</li> </ul>	<ul style="list-style-type: none"> <li>High efficiency</li> <li>Fuel flexibility</li> <li>Can use a variety of catalysts</li> <li>Solid electrolyte</li> <li>Suitable for CHP &amp; CHHP</li> <li>Hybrid/GT cycle</li> </ul>	<ul style="list-style-type: none"> <li>High temperature corrosion and breakdown of cell components</li> <li>High temperature operation requires long start up time and limits</li> </ul>

**Figure 1.** Comparison of Fuel Cells. Reproduced from<sup>2</sup>

While each kind of fuel cell has its own advantages and disadvantages, the US Department of Energy has decided that the PEMFC is the best candidate for use in vehicular transportation, primarily due to lower operating temperatures and simpler design possibilities due to the absence of a corrosive liquid electrolyte. The benefits of a viable, vehicular PEMFC compared to the internal combustion engine are improved efficiency, greater energy independence, and cleaner emissions.<sup>3</sup>

Fuel cells generate power by separating two electrochemical reactions and through using an electrically insulative electrolyte that allows the transfer of ions to

maintain neutrality.<sup>1</sup> Figure 2 is an example of the membrane electrode assembly (MEA) of a proton exchange membrane (PEM) fuel cell. In a PEM fuel cell hydrogen flows to a gas diffusion layer (GDL) where it disperses onto the anode. The hydrogen is then split into protons and electrons. The protons travel through the membrane to the cathode and the electrons generate power by travelling through a circuit on their way to the cathode. Concurrently, oxygen travels to and disperses through another GDL onto the cathode, where it reacts with the protons and electrons to form water. The water and any unreacted gas then disperse through and out of the GDL and leave the MEA.



**Figure 2.** MEA of a PEM Fuel Cell. Adapted from<sup>4</sup>

While the PEMFC shows promise for vehicular application, several roadblocks have kept it from viability: the cathode catalyst for the oxygen-reduction reaction (ORR),

hydrogen usage, and logistics. The only viable cathode catalyst for PEMFC is platinum or an alloy thereof. While great strides have been made with regards to platinum activity,<sup>5</sup> its availability is uncertain and its price volatile.<sup>6, 7</sup> Moreover, before purification, the vast majority of hydrogen produced contains carbon monoxide and sulfur, both of which are known poisons of platinum.<sup>3, 8-11</sup> Therefore, to use hydrogen and avoid significant deactivation of the platinum catalyst at the anode, the hydrogen must be very pure or another technology would need to demonstrate that it could meet the expected demands of quantity and purity. Either way involves significant cost. Additional cost is accrued by the necessity of high pressures to achieve the desired activity and volume requirements.<sup>3,</sup>  
<sup>12</sup> As if the cost of using hydrogen was not trouble enough, the public is fearful of using hydrogen as a fuel, perhaps due to negative association with the Hindenburg incident.<sup>9, 13,</sup>  
<sup>14</sup> Finally, the inputs of economic analyses of PEMFC prepared for the U.S. Department of Energy are from disparate companies and an economically viable PEMFC has yet to be demonstrated.<sup>12</sup>

The expense of platinum has driven research for alternative non-precious metal catalysts (NPMCs) for use in PEMFC. NPMC have been synthesized using abundant and inexpensive precursors and have demonstrated qualities that are desirable for use in PEMFC. Although less expensive, NPMC have not yet reached activity and stability comparable to platinum. Nonetheless, NPMC could still be a viable catalyst since higher loadings can be used to compensate for lower activity. Ultimately, whether NPMC are

used in PEMFC or not will be determined by the achievable power density within desired loading requirements.<sup>15, 16</sup>

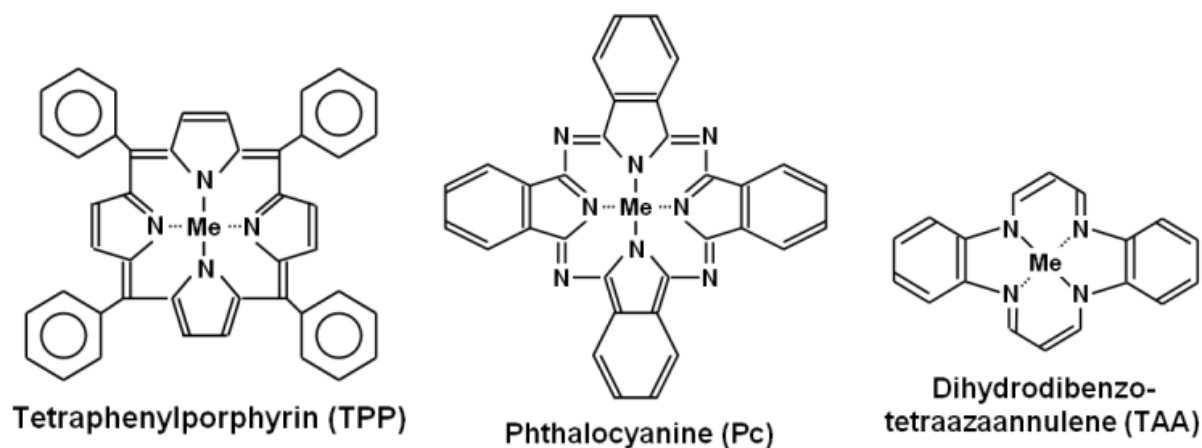
This project is concerned with the development of NPMC for PEMFC and is focused on improving catalytic activity of a subclass of NPMC denoted Fe/N/C so that they could eventually operate comparably to platinum. The subclass Fe/N/C will be discussed in greater detail in the literature review.

Several Fe/N/C catalysts were synthesized and electrochemically tested for this project. The effects of preparation parameters were statistically analyzed with the intent of determining which parameters significantly affect activity. This project aimed to examine the feasibility of using statistical modeling for estimation of the influence of preparation parameters on catalytic activity of NPMC towards the ORR with the long-term goal of optimization of catalytic activity and eventual marketability of NPMC catalysts. A first-order experimental design was used and yielded parameter estimates of -16.6 mV, 16.6 mV, -20.6 mV, and 20.6 mV for Ketjen black, Black pearls, acetonitrile, and ammonia. Although the model was significant, it did not fit the data well.

## Literature Review

NPMC for fuel cells were pioneered almost 50 years ago by Jasinski using cobalt phthalocyanine (CoPc) in an alkaline solution.<sup>17</sup> Subsequently, NPMC have undergone three major stages of development and comprise materials ranging from heteropoly acids to carbon nanotubes.<sup>18</sup> The first NPMC for fuel cells were chelated-transition-metal macrocycles whose use as a catalyst for fuel cells was inspired by heme and the usage of metal phthalocyanines in the oxidation of organic molecules.<sup>17, 19</sup> The coordinated-metal centers were reported to form bridged oxygen complexes with the potential for the four electron reduction of oxygen.<sup>20, 21</sup> Although these catalysts were active for ORR, they lacked the stability for use in a fuel cell environment and have been used mainly to investigate the active site and ORR mechanism.<sup>21-23</sup> Moreover, macrocycles can be expensive and thereby defeat the objective of finding inexpensive alternatives to platinum. Examples of macrocyclic compounds are given in Figures 3.





**Figure 3.** Metal Macrocycles as Reproduced from<sup>24</sup>.

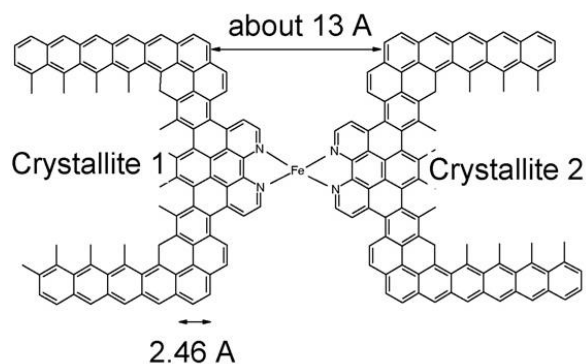
The next stage in NPMC development occurred when the aforementioned macrocycles were subjected to a thermal pretreatment. This was found to improve the activity and stability of the NPMC and this improvement was found to depend upon the macrocyclic compound, carbon support, treatment environment (e.g. inert, reductive, etc.), and temperature.<sup>23, 24</sup> There are several schools of thought concerning how the thermal treatment improves activity and stability. van Veen *et al.* proposed that the stability improvement is caused by the fringes of the macrocycle bonding with the carbon support, thereby removing the portion of the macrocycle most susceptible to oxidative attack and that the activity improvement is due to a change in the electron density around the metal ion resulting in a more favorable redox potential.<sup>25</sup> Yeager *et al.* proposed that heat treatment causes the macrocycles to undergo decomposition and produce surface nitrogen species that serve as adsorption sites for the active metal ions.<sup>20, 21</sup> Another view

proposed that the metal was not part of the active site.<sup>26</sup> A significant characteristic of this stage in NPMC development was the ambiguity of the active site, which was inherited by the third and current stage in development.

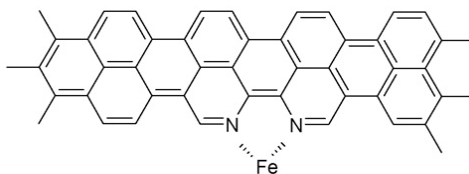
In 1989, Gupta *et al.* used separate transition metal and nitrogen sources to create NPMC with activity comparable to traditional NPMC catalysts in alkaline and acidic media.<sup>27</sup> This demonstrated that the metal need not be coordinated with nitrogen prior to heat treatment to obtain active ORR catalysts. Since then numerous combinations of precursors and treatment conditions have been reported in the literature. The general consensus is that an active ORR catalyst requires: (1) a transition metal - thus far Fe and Co have produced the most active catalysts, (2) a source of nitrogen, (3) a carbon source, and (4) an activation step, which is typically thermal.<sup>18, 28-31</sup>

As mentioned in the introduction, the subclass of NPMC titled Fe/N/C will be discussed. The literature describes varied methods of NPMC preparation and testing, which has led to the proposition that there are two probable types of active sites in NPMC catalyst that are prepared with a transition metal, carbon, and nitrogen precursors: a nitrogen-chelated transition-metal moiety (M/N/C) and a nitrogen-doped carbon (CN<sub>x</sub>).<sup>18, 28-31</sup> The majority of the catalysts mentioned in this literature review could be considered Fe/N/C or Fe/N/C-like, with a proposed active site consisting of a nitrogen-coordinated iron ion as shown in Figures 4 and 5. Wiesener proposed an alternative active site where the metal activates the carbon, but is not part of the active site.<sup>26, 32</sup> Matter *et al.* proposed

a similar, more specific, active site comprised of pyridinic nitrogen located on graphitic edge planes. This material has subsequently been called  $\text{CN}_x$ .<sup>33</sup> Both  $\text{CN}_x$  and  $\text{Fe/N/C}$  require carbon, nitrogen, a transition metal, and high temperature heat treatment in order to be active for the ORR.<sup>18, 28-31</sup> Nonetheless, there are two main differences: the morphology and the role of the metal.



**Figure 4.** Proposed  $\text{FeN}_{2+2}/\text{C}$  Active Site.<sup>34</sup>

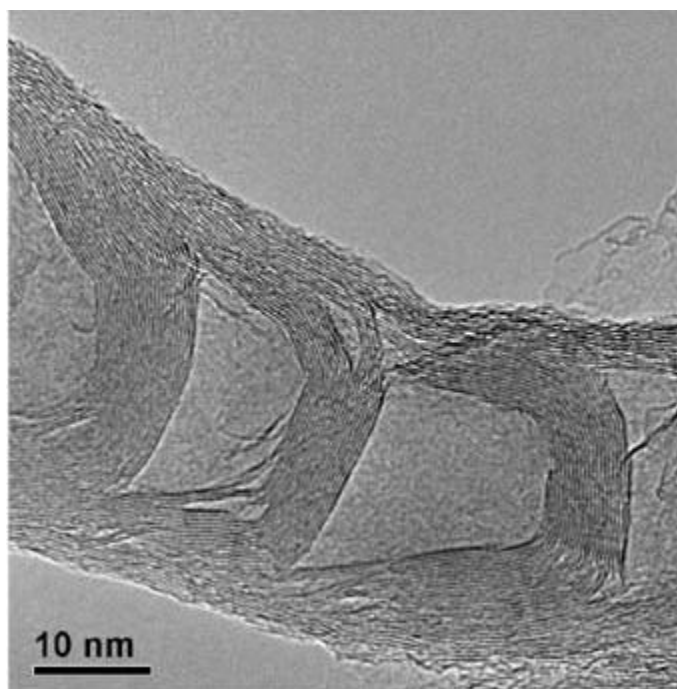


**Figure 5.** Proposed  $\text{FeN}_2/\text{C}$  Active Site.<sup>34</sup>

The CN<sub>x</sub> prepared by Matter *et al.* used an Fe/MgO growth catalyst.<sup>33</sup> Metal particles - especially Fe, Co, and Ni - have long been used to grow carbon nanotubes (CNT) and carbon nanofibers (CNF).<sup>35-40</sup> More recently, metals supported on metal oxides have also shown this ability – including iron supported on magnesia.<sup>41-56</sup> Thus, it is reasonable to assume that the Fe/MgO catalyst used by Matter *et al.* also grew carbon nanofibers. This hypothesis was supported by Mössbauer analysis of the iron.<sup>57</sup> However, the metallic precursors used for Fe/N/C catalysts are typically treated in inert or ammonia.<sup>28</sup> Therefore, since CNT growth using a metal catalyst usually requires a gaseous hydrocarbon or hydrocarbon-like reactant, it is unlikely that the metallic precursor used for Fe/N/C significantly catalyzes the growth of CNT or CNF. Indeed, Lefevre *et al.* used Time-of-Flight Secondary Ion Mass Spectrometry (ToF-SIMS) to show that ORR activity correlated with the observation of an FeN<sub>2</sub>C<sub>4</sub><sup>+</sup> ion<sup>58</sup>, leading them to the conclusion that iron ions are coordinated by pyridinic nitrogens.<sup>58-60</sup> Additionally, when the metal is present above a threshold, the excess metal induces graphitization of nearby carbon and the formation of metal carbides, which are inactive towards the ORR.<sup>61, 62</sup>

The morphological differences between CN<sub>x</sub> and Fe/N/C are apparent considering CN<sub>x</sub> is composed primarily of nanofibers and the morphology of Fe/N/C is amorphous since it is primarily carbonaceous support. CN<sub>x</sub> is nitrogen doped carbon nanofibers that

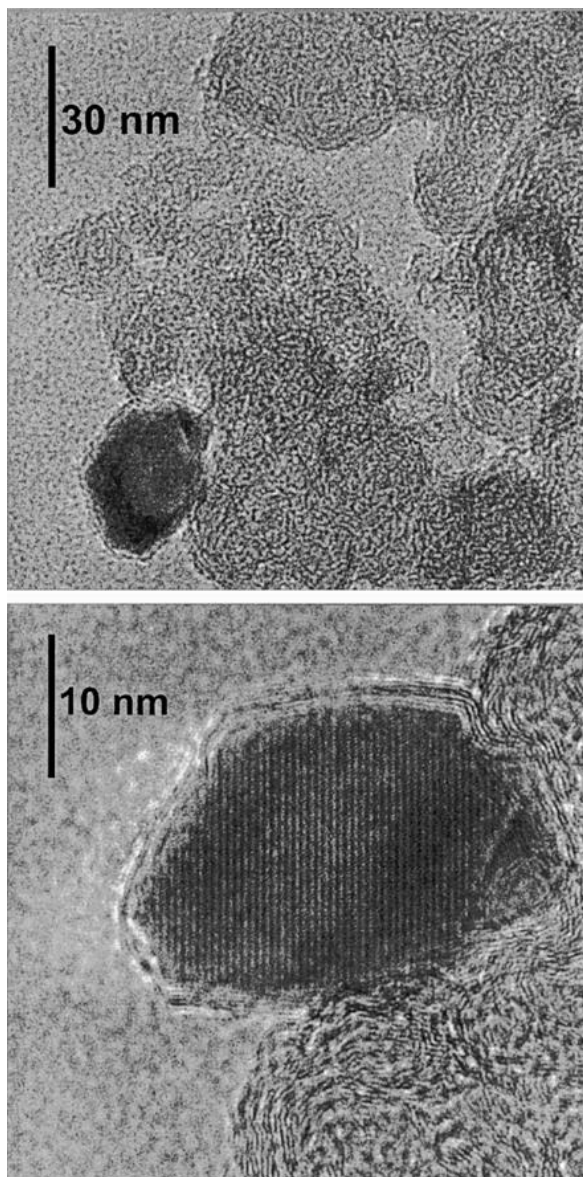
have mostly assumed stack cup structure as seen in Figure 6, and its activity correlates to the amount of pyridinic nitrogen and graphitic edge planes.<sup>33, 63-65</sup>



**Figure 6.** Stacked Cups Grown on Fe/MgO.<sup>33</sup>

The morphology of Fe/N/C is largely determined by the carbon support, which also strongly influences activity towards the ORR.<sup>66, 67</sup> Figure 7 presents an example of Fe/N/C morphology. Correlation between microporous area of pristine carbon support, microporous area created through ammonia etching, degree of disorder of the carbon

support, surface nitrogen content and ORR activity for Fe/N/C catalysts has been observed.<sup>66-76</sup>



**Figure 7.** TEM of Fe/N/C.<sup>77</sup>

## **Experimental Methods**

### **Catalyst Preparation**

Catalysts for this project were prepared for three separate sections of experiments: (1) main section, (2) acid-washed section, and (3) third-heat treatment section. Although the preparation varied somewhat for each section, the general experimental procedures were similar and started with a wetness impregnation (WI), followed by ballmilling, an inert pyrolysis, and concluded with a reactive pyrolysis.

#### **Wetness Impregnation (WI)**

In the first preparation step a carbon support, iron precursor, and 1,10-phenanthroline (Sigma-Aldrich) were mixed in a 150 mL solution of 2DI-H<sub>2</sub>O:1EtOH and heated in a water bath at 60 °C until ~50 mL of mixture remained. The WI was then placed into a drying oven at 90 °C overnight until the solvent completely evaporated. After the solvent evaporated, the next step was ballmilling. In order to ensure desirable particle size, the dried WI was ground in a mortar and pestle prior to ballmilling.

## **Ballmilling**

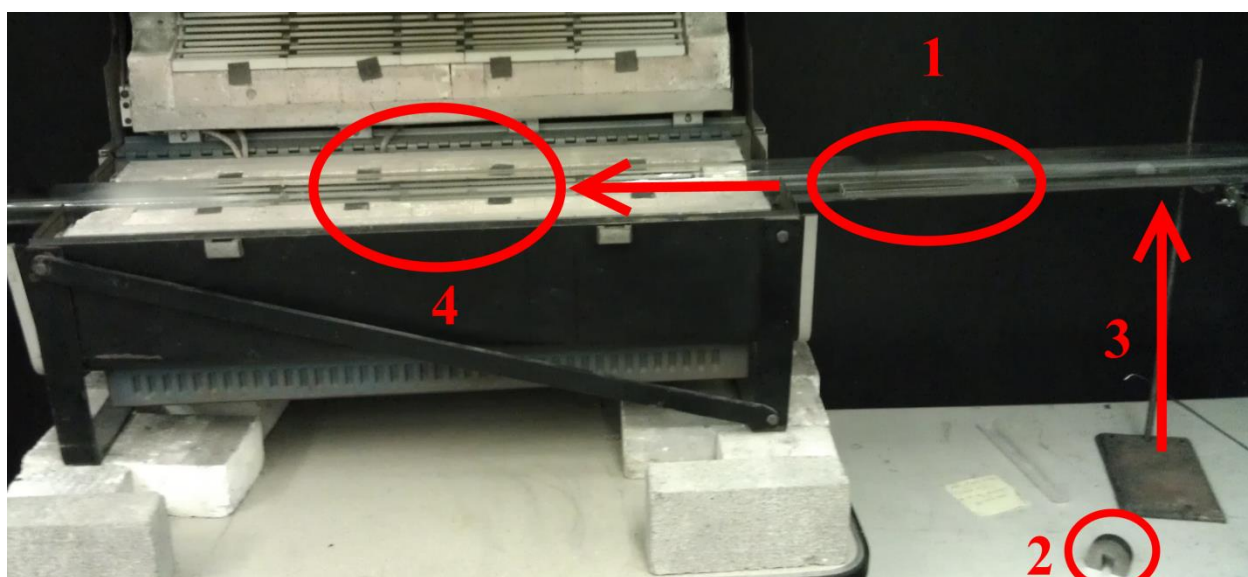
The dried WI was placed into a mill jar along with 20 chrome steel balls. The jar and its lid were then placed into a glove bag, which was subsequently purged with nitrogen for at least 30 min. After 30 min, the mill jar was sealed and removed from the glove bag. This step was performed to ensure that there was no oxygen in the sample while it was ballmilling since the oxygen could have reacted with the carbonaceous support and reduced yield. Once the mill jar was purged, it was placed on the ballmill which ran at 200 rpm for 180 min. The ballmilled product was then heat treated in an inert gas.

## **Inert Pyrolysis**

After ballmilling, the carbonaceous product was placed in a quartz boat which was subsequently placed in a quartz tube. The tube was purged with inert that flowed at 150 sccm for at least 30 minutes before pyrolysis. After purging, the furnace was heated from room temperature to 1050 °C and once the furnace reached this temperature the quartz boat containing the sample was pushed into the hot zone of the furnace and remained there in an inert atmosphere for 60 min. Afterwards, the quartz tube was removed from the furnace and cooled to room temperature while inert continually flowed



through it. Refer to Figure 8 for a description of the pyrolysis system. After the sample cooled to room temperature, it was removed from the quartz tube and awaited reactive pyrolysis.



**Figure 8.** Pyrolysis System.

\*Quartz boat (1) and a magnet (2) that is used to move a glass rod (3) such that it pushes the quartz boat into the hot zone (4).

## Reactive Pyrolysis

The procedure for the reactive pyrolysis differed for each section and the differences will be described in their respective sections. After inert pyrolysis, the sample was again placed in a quartz boat, which was placed into a quartz tube. The tube was purged with a reactive gas, typically ammonia, flowing at ~150 ccm for at least 30 min

before pyrolysis. After purging the furnace was heated to 950 °C, and once the furnace reached that temperature, the quartz boat containing the sample was pushed into the hot zone and typically remained there under ammonia for 20 minutes. Afterwards, the quartz tube was removed from the furnace and cooled to room temperature while inert continually flowed through it. After the sample cooled to room temperature, it was removed from the quartz tube and was electrochemically tested.

## Main Section

For the catalysts in this section, the general experimental flow described above was followed with the caveat that the carbon support, acetate/nitrate precursor (both Sigma-Aldrich), inert gas, reactive gas, and reactive gas pyrolysis duration were all varied according to a randomized list generated by the statistical software JMP®.<sup>78</sup> This process will be discussed in greater detail in Appendix A. Table 1 details the precursors and conditions that were varied, while the list of samples and their corresponding precursors and conditions is given in Table 2.

**Table 1.** List of Precursors and Experimental Conditions.

Carbon Support	Acetate: Nitrate Precursors*	Inert Gas	Reactive Gas	Reactive Gas Pyrolysis Duration (min)
Ketjen Black (KB)	1:0	Argon	Ammonia	5
Black Pearls (BP)	1:1	Nitrogen	Acetonitrile**	20
	0:1			40

\* Iron(II) acetate and iron(III) nitrate•nonahydrate were the precursors used and the ratios are on an iron basis.

\*\* Acetonitrile saturated nitrogen.

**Table 2.** List of Samples and their Corresponding Experimental Conditions.

Sample	Carbon Support	Acetate: Nitrate Precursors	Inert Gas	Reactive Gas	Reactive Pyrolysis Duration (min)
1	BP	1:0	Ar	CH <sub>3</sub> CN	40
2	KB	1:1	N <sub>2</sub>	NH <sub>3</sub>	40
3	KB	1:1	Ar	NH <sub>3</sub>	5
4	BP	1:0	Ar	NH <sub>3</sub>	5
5	BP	1:0	N <sub>2</sub>	NH <sub>3</sub>	40
6	BP	0:1	Ar	CH <sub>3</sub> CN	5
7	KB	1:0	N <sub>2</sub>	CH <sub>3</sub> CN	20
8	BP	1:0	N <sub>2</sub>	NH <sub>3</sub>	5
9	BP	1:1	Ar	CH <sub>3</sub> CN	20
10	KB	0:1	N <sub>2</sub>	NH <sub>3</sub>	5
11	BP	1:1	N <sub>2</sub>	NH <sub>3</sub>	20
12	BP	0:1	Ar	NH <sub>3</sub>	40
13	KB	1:0	Ar	CH <sub>3</sub> CN	5
14	KB	1:0	Ar	NH <sub>3</sub>	20
15	BP	0:1	N <sub>2</sub>	CH <sub>3</sub> CN	20
16	KB	1:1	Ar	CH <sub>3</sub> CN	40

The procedure used to prepare the main section samples followed the aforementioned description with the caveat that the parameters were varied according to Table 2.

The acetonitrile samples followed a similar procedure as the ammonia samples. The sample was placed into a quartz boat, which was placed into a quartz tube. Nitrogen purged an acetonitrile bubbler for ~30 min before the quartz boat was placed into the quartz tube. Nitrogen bubbled through acetonitrile such that the flow rate of the acetonitrile saturated nitrogen was ~150 sccm. The acetonitrile saturated nitrogen, from now on referred to simply as acetonitrile, purged the quartz tube for at least 30 min before pyrolysis. The furnace was heated to ~900 °C, and once this temperature was reached, the furnace was opened and the quartz tube was placed into the furnace. The time at which the furnace reached 900 °C again was the reference point used as the start of the reactive pyrolysis. The pyrolysis duration varied according to Table 2. Afterwards,

the quartz tube was removed from the furnace and cooled to room temperature while inert flowed through it. After the sample cooled to room temperature, it was removed from the quartz tube and was electrochemically tested.

### Acid Washed Section

For the catalysts in this section, deviations from the outlined procedure will be described. Samples were washed at different stages in the preparation process as described in Table 3.

**Table 3.** List of Acid Washed Samples and their Experimental Conditions.

Sample	Carbon Support	Acetate: Nitrate Precursors	Inert Gas	Reactive Gas	Reactive Pyrolysis Duration (min)	Acid Wash (HNO <sub>3</sub> )
1	KB	1:0	N <sub>2</sub>	N/A	N/A	Before inert pyrolysis
2	KB	1:0	N <sub>2</sub>	NH <sub>3</sub>	5	Before inert pyrolysis
3	KB	1:0	N <sub>2</sub>	N/A	N/A	N/A
4	KB	1:0	N <sub>2</sub>	N/A	N/A	After inert pyrolysis
5	KB	1:0	N <sub>2</sub>	NH <sub>3</sub>	5	N/A
6	KB	1:0	N <sub>2</sub>	NH <sub>3</sub>	5	Between inert and reactive pyrolyses
7	KB	1:0	N <sub>2</sub>	NH <sub>3</sub>	5	After reactive pyrolysis

The procedure used to prepare the acid washed samples followed the aforementioned description with the caveat that the parameters were varied according to Table 3, the pyrolysis duration was 5 minutes, samples 1 & 2 were acid washed before inert pyrolysis, and sample 6 was washed before reactive pyrolysis.

## Acid Wash

250 mL of 1M HNO<sub>3</sub> was prepared by dilution of concentrated HNO<sub>3</sub>. The nitric acid was poured into a 500-mL rounded bottom flask (RBF), which was placed into a water bath and heated to 60 °C. Once this temperature was reached, the sample was added to the acid, along with a stir bar, and was stirred at 60 °C for 60 min. Afterwards, the acidic mixture of the sample and solution was filtered using a Büchner funnel and was rinsed with ~1L of DI-H<sub>2</sub>O. The filter cake was then rinsed into a beaker using ~100 mL of DI-H<sub>2</sub>O, and was then placed into a drying oven at ~110 °C overnight.

## Third-Heat Treatment Section

The procedure used to prepare the acid washed samples followed the aforementioned description with the caveat that the parameters were varied according to Table 4, the pyrolysis durations were 20 min, and reactive gas used in the second and third heat treatments were reversed for the two samples as described in Table 4.

**Table 4.** List of Third-Heat Treatment Samples and their Corresponding Experimental Conditions.

Sample	Carbon Support	Acetate: Nitrate Precursors	Inert Gas	First Reactive Gas	First Reactive Pyrolysis Duration (min)	Second Reactive Gas	Second Reactive Pyrolysis Duration (min)
1	BP	1:0	N <sub>2</sub>	NH <sub>3</sub>	20	CH <sub>3</sub> CN	20
2	BP	1:0	N <sub>2</sub>	CH <sub>3</sub> CN	20	NH <sub>3</sub>	20

## Electrochemical Testing

The activity of the samples towards the ORR was measured through cyclic voltammetry (CV) using a Princeton Applied Research Bi-Stat potentiostat and a 616 Rotating Disk Electrode (RDE) setup. All tests were performed using 0.5 M H<sub>2</sub>SO<sub>4</sub> electrolyte, an Ag/AgCl (sat. KCl) reference electrode, and a Pt wire counter electrode. The CVs swept from 1.2 to 0.0 to 1.2 V vs. Reversible Hydrogen Electrode (RHE).

Catalyst ink was prepared by adding 95  $\mu$ L 5wt% Nafion in aliphatic alcohols and 350  $\mu$ L 200 proof EtOH to 10 mg catalyst. This mixture was subsequently sonicated for an hour. Next, a 7  $\mu$ L aliquot of catalyst ink was applied to the glassy carbon disk electrode and allowed to dry for 15 minutes. Before testing began the electrolyte was saturated with oxygen, then CVs were run at 50 mV/s until the polarization curves overlapped so that any gaseous species or impurities would be removed from the catalyst surface. Subsequently, CVs were run at 10 mV/s at 0, 100, and 1000 rpm in oxygen saturated electrolyte. Testing was repeated in argon sparged electrolyte to obtain a background.

The ORR activity, also called onset potential, was defined as the voltage at which the current from the 0 rpm oxygen scan was 10% greater than that of the argon background scan. Additional measures of performance are the peak potential,  $V_{pr}$ , which is defined as the voltage where the current minima occurred in the 0 rpm oxygen CV, and potential when  $-0.1 \text{ mA/cm}^2$  was reached,  $V_{-0.1}$ .

## Statistical Design

The goal of using a statistical model was to be able to qualitatively compare the effects of various parameters on the activity of the Fe/N/C catalysts and to determine the efficacy of using a statistical model for analysis and predication of the catalytic activity of NPMC towards the ORR.

The first step in designing the model for the main section was to determine the response variables. The responses were chosen based on indicators that are found in the literature: onset potential, voltage when a given current was reached, and peak voltage during cyclic voltammetry (CV) with no rotation. These responses are described in the electrochemical testing section of the experimental methods.

The next step was to determine the factors for the model. The factors were chosen based on perceived influence on activity and what was discussed in the literature. They were: carbon black support, iron (acetate:nitrate) precursors, inert gas, reactive gas, and reactive gas pyrolysis duration.

The last steps were to determine the model order and number of runs. These are related because the order of a model and number of factors affect the required number of runs. To be practical, the model was kept at first order with no interaction terms. The number of runs (samples) was 16. Refer to Appendix A for more information concerning the experimental design and statistical analysis.

The model generated for statistical testing using JMP® was

$$y = \mu + CB_i + FeP_j + IG_k + PG_l + PD_m + \varepsilon$$

where  $\mu$  = mean and  $\varepsilon$  = random error. Table 5 describes the factors and responses included in the model.

**Table 5.** Factors and Responses included in Main Section Statistical Model.

y (response)	CB <sub>i</sub>	FeP <sub>j</sub>	IG <sub>k</sub>	PG <sub>l</sub>	PD <sub>m</sub> (min)
Onset potential	Ketjen Black (KB)	1:0	Argon	Ammonia	5
V <sub>-0.1</sub>	Black Pearls (BP)	1:1	Nitrogen	Acetonitrile	20
V <sub>pr</sub>		0:1			40

Note: CB denotes carbon black support, FeP denotes the ratio between iron precursors (acetate:nitrate) on an iron basis, IG denotes inert gas, PG denotes pyrolysis gas, and PD denotes pyrolysis duration.

The experimental results were analyzed using JMP® and the results will be discussed in the following section.



## Results and Discussion

### Main Section Results

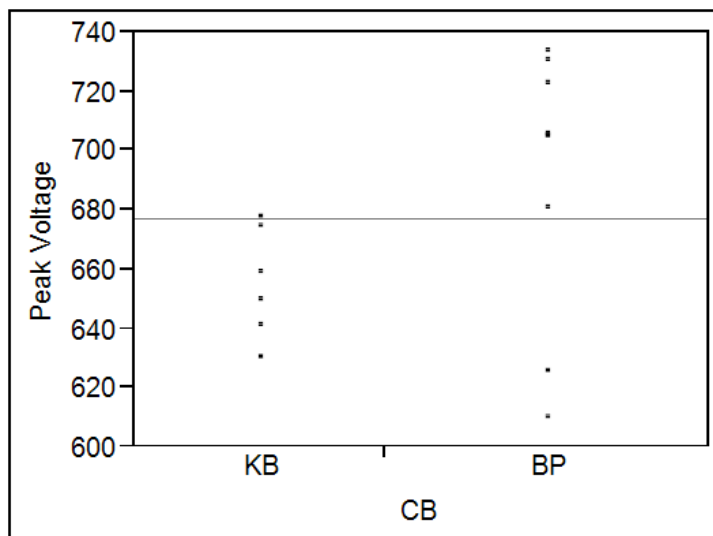
The experimental results were analyzed using JMP® and the obtained results are presented based on factor.

#### Carbon Black Support

Ketjen black and Black pearls were used as supports for the samples in this study, and their effect on onset potential and  $V_{-0.1}$  was not found to be statistically significant. The effect of carbon support on peak voltage was found to be significant with p-value of 0.0464. The parameter estimate for the effect of Ketjen black was -16.6 mV and 16.6 mV for Black pearls for the model

$$y = \mu + CB_i + PG_l + \varepsilon$$

The power obtained for the carbon support was 0.38 with an LSN of 22. Figure 9 compares the effect of Ketjen black to that of Black pearls. It is not surprising that the carbon support should be found to be statistically significant considering it has been noted to affect ORR activity.<sup>67, 74</sup> Moreover, Black pearls has more microporous surface area than Ketjen black, which enables greater active site formation.<sup>69</sup>



**Figure 9.** Comparison of Peak Voltage by Ketjen Black (KB) and Black Pearls (BP).

### Iron Precursor Ratio

Iron(II) acetate and iron(III) nitrate•nonahydrate were used as precursors for the samples in this study. Their effect was not found to be statistically significant for all responses. The power of the iron precursor effect ranged from 0.0587 to 0.1505 and LSN from 67 to 674. These results are expected considering that many metal precursors have been used,<sup>18, 24, 28</sup> but found to not control the ORR activity.<sup>70</sup>

### Inert Gas

Nitrogen and argon were used as the inert gases for the inert pyrolysis step in this study. Their effect was not found to be statistically significant for all responses. The power of the inert gas effect ranged from 0.0539 to 0.1158 and LSN from 99 to 1567. It

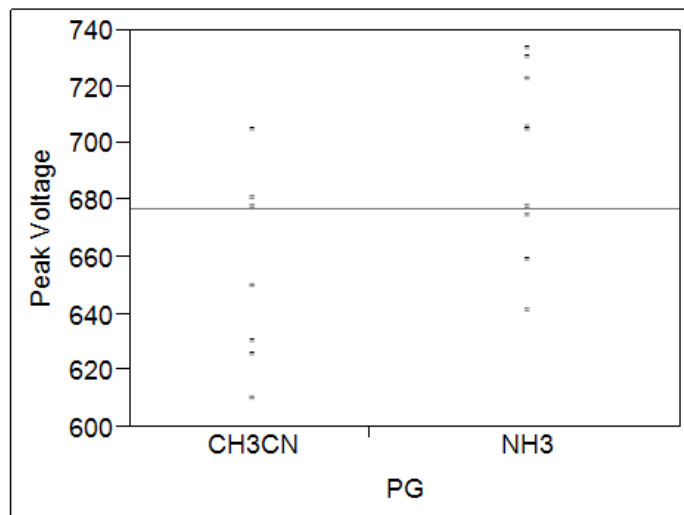
was expected that the effect of inert gas would not have a significant effect on the ORR activity.<sup>79</sup>

### **Pyrolysis Gas**

Ammonia and acetonitrile were used as the reactive gases in the reactive gas pyrolysis step in this study. The effect of reactive gas on onset potential and  $V_{-0.1}$  was not statistically significant. However, the effect of reactive gas on  $V_{pr}$  was found to be significant with p-value of 0.0177 for the model

$$y = \mu + CB_i + PG_l + \varepsilon$$

The parameter estimate for the effect of acetonitrile was -20.5 mV and 20.5 mV for ammonia. The power obtained for the reactive gas was 0.58 with LSN of 14. Figure 10 compares the effect of acetonitrile to that of ammonia.



**Figure 10.** Comparison of  $V_{pr}$  (peak voltage) Obtained using either Ammonia or Acetonitrile as Pyrolysis Gas (PG).

These results are reasonable considering that the ORR activity has been found to correlate to the microporous surface area and ammonia is known to etch the carbon support, whereas acetonitrile causes deposition.

### Pyrolysis Duration

The duration of the reactive pyrolysis was varied at 5, 20, and 40 minutes in this study. The effect of duration was not found to be statistically significant for all responses. The duration effect power ranged from 0.054 to 0.0736 with LSN from 255 to 1443. These results are expected considering that 5 to 12 minutes has been found to be sufficient for site formation.<sup>76</sup>

## Overall Model

The effect size of the iron precursors, inert gas, and pyrolysis duration are likely the reason these factors were not found to be significant. Moreover, only  $V_{pr}$  a sensitive enough response for the experimental design to yield a statistically significant model

$$y = \mu + CB_i + PG_l + \varepsilon$$

where the parameter estimates are: acetonitrile: -20.5 mV, ammonia: 20.5 mV, Ketjen black: -16.6 mV, and Black pearls: 16.6 mV. The LSN for the carbon support factor was 22 and for the pyrolysis gas was 14. The overall model power was 0.22. The model Rsquare was 0.48, Rsquare Adjusted was 0.40, and Max Rsquare was 0.61. These results indicate that the model does not fit the data well, even though it is statistically significant.

The results obtained suggest that  $V_{pr}$  would be more viable as a response for future analysis than onset potential and  $V_{-0.1}$ . Perhaps this is attributable to its theoretical background.<sup>80</sup> However, the experimental design was fairly simple in that it did not include interactions between factors, and this could have affected the perceived sensitivity of the other factors and contributed to the poor fit of the obtained model.

## Acid Wash Results

Figure 11 displays the CVs of the acid washed samples and Figure 12 presents a close up. Two trends are apparent: first is that acid washed samples show reduced activity compared to unwashed samples and the second is that an ammonia treatment increases activity.

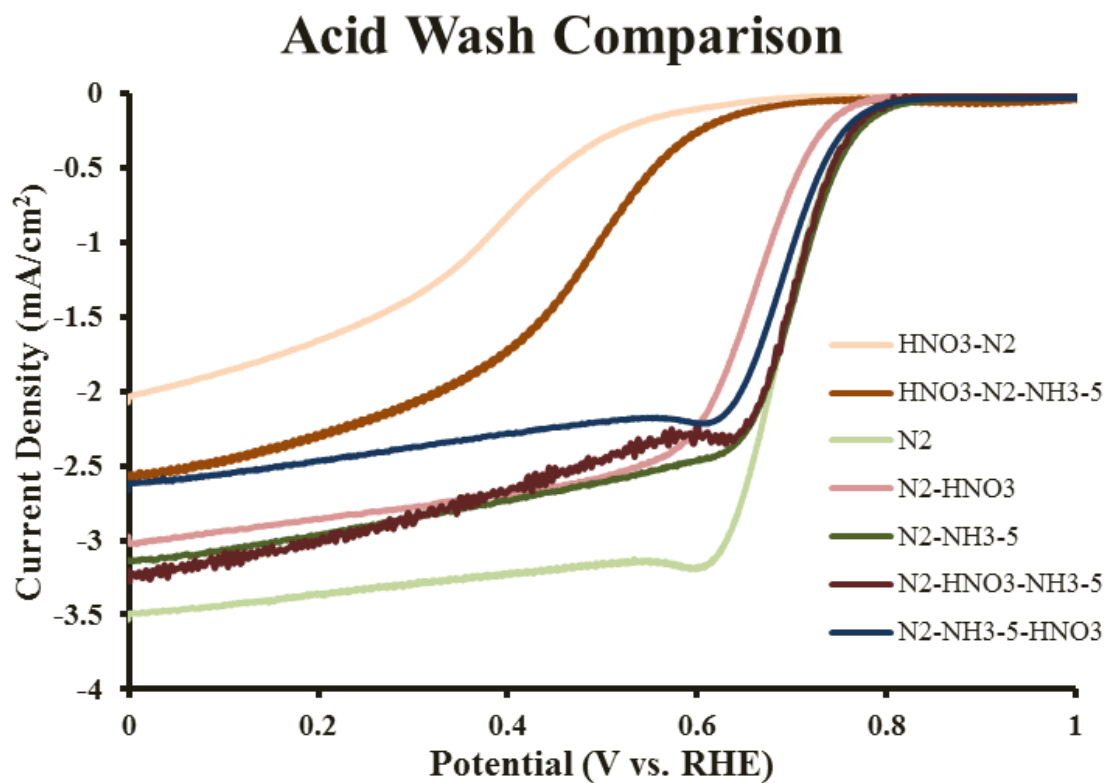
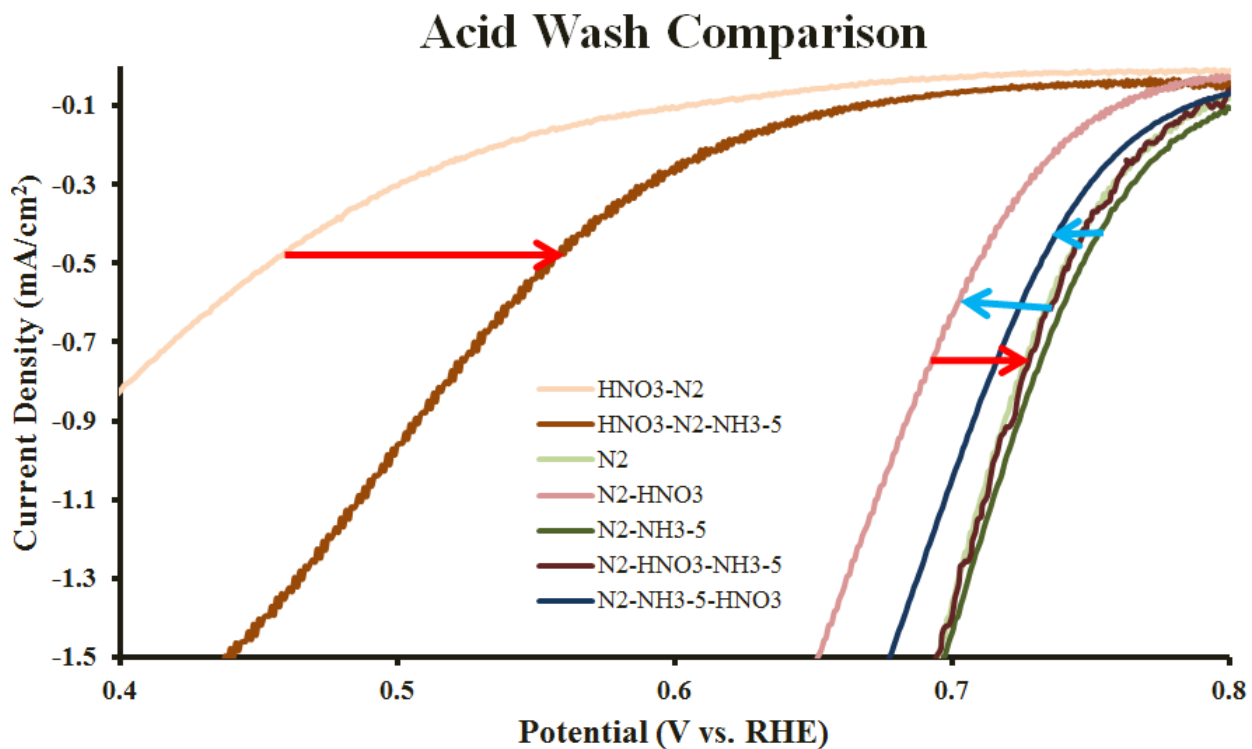


Figure 11. Comparison of Activity of Acid Washed Samples.



**Figure 12.** Close-up of Acid Wash Comparison with Red Arrows Showing Ammonia Activation and Blue Arrows Acid Wash Deactivation.

Note that the legend indicates the order of treatments.

The decrease in activity after acid washing could be attributed to leaching of iron from the carbon support.<sup>71</sup> Table 6 describes the preparation and activity of the acid washed samples.

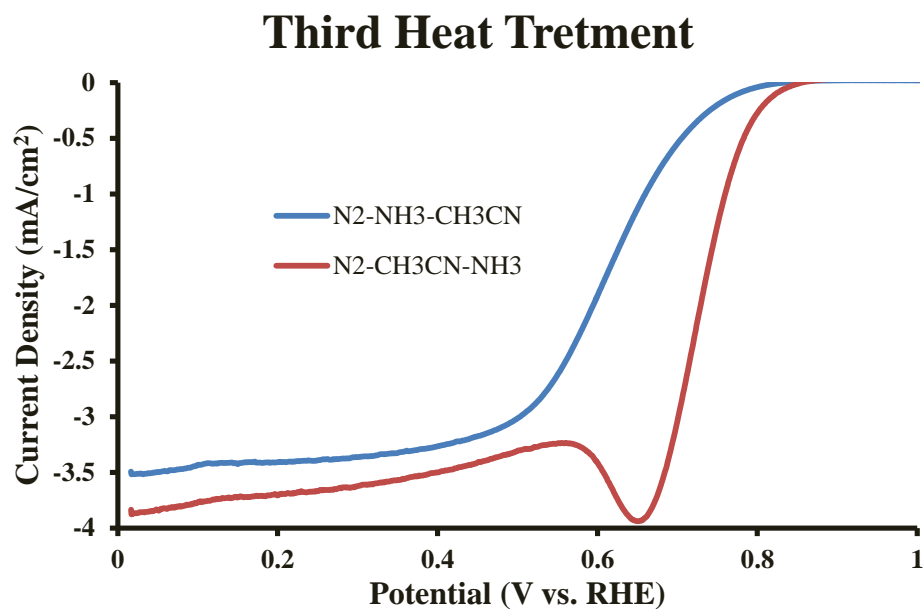
**Table 6.** Description of Acid Washed Samples and their Activity.

Sample	Carbon Support	Acetate: Nitrate Precursors	Inert Gas	Reactive Gas	Reactive Pyrolysis Duration (min)	Onset Potential (mV)	V <sub>-0.1</sub> (mV)	Acid Wash (1M HNO <sub>3</sub> )
1	KB	1:0	N <sub>2</sub>	N/A	N/A	630	602	Before inert pyrolysis
2	KB	1:0	N <sub>2</sub>	NH <sub>3</sub>	5	649	657	Before inert pyrolysis
3	KB	1:0	N <sub>2</sub>	N/A	N/A	815	796	N/A
4	KB	1:0	N <sub>2</sub>	N/A	N/A	763	809	After inert pyrolysis
5	KB	1:0	N <sub>2</sub>	NH <sub>3</sub>	5	852	806	N/A
6	KB	1:0	N <sub>2</sub>	NH <sub>3</sub>	5	790	799	Between inert and reactive pyrolyses
7	KB	1:0	N <sub>2</sub>	NH <sub>3</sub>	5	806	784	After reactive pyrolysis

## Third Heat Treatment Results

Figure 13 displays the CVs of the thrice heat treated samples. The difference in activity between the N<sub>2</sub>-NH<sub>3</sub>-CH<sub>3</sub>CN and N<sub>2</sub>-CH<sub>3</sub>CN-NH<sub>3</sub> samples could be attributed to carbon deposition over active sites formed by ammonia etching and/or other surface modifications caused by heat treatment in acetonitrile.





**Figure 13.** Comparison of Activity of Third Heat Treatment Samples.

Note that the legend indicates the order of gases used.

Table 9 describes the preparation and activity of the third heat treatment samples.

**Table 7.** Description of Third Heat Treatment Samples and their Activity.

Sample	Carbon Support	Acetate: Nitrate Precursors	Inert Gas	First Reactive Gas	First Reactive Pyrolysis Duration (min)	Second Reactive Gas	Second Reactive Pyrolysis Duration (min)	Onset Potential (mV)	$V_{-0.1}$ (mV)
1	BP	1:0	N <sub>2</sub>	NH <sub>3</sub>	20	CH <sub>3</sub> CN	20	807	769
2	BP	1:0	N <sub>2</sub>	CH <sub>3</sub> CN	20	NH <sub>3</sub>	20	822	822

## Conclusions

Although most of the statistical results obtained were not significant, there is still much that can be learned from them. For instance, the Fe/N/C catalyst preparation procedure is a fairly robust process with respect to activity. The means and corresponding standard deviations for the responses were 677 mV & 39 mV, 815 mV & 20 mV, and 842 mV & 10mV for  $V_{pr}$ ,  $V_{-0.1}$ , and onset potential respectively. On another note, the LSN values obtained indicate that using onset potential or  $V_{-0.1}$  as an indicator of activity requires more samples (at least for the models used), and that  $V_{pr}$  is a more practical indicator of activity for statistical analysis. The results also demonstrate that modeling of NPMC activity towards the ORR is feasible. However, the responses and experimental design should be chosen carefully. The design should also include the ability to estimate interaction terms between factors, as ignoring them could contribute to poor fit to the data. Finally, the procedure used in the main section appears to either be close to an optimum<sup>81</sup> and/or the factors that were not varied (i.e. ballmilling duration, gas flow rates, etc.) are more influential on activity.

Acid washing appeared to deactivate the Fe/N/C catalysts, which could be attributed to iron removal. Further stability testing should be conducted to see if the activity loss comes with an increase in stability and if that stability increase would be valuable for other more active Fe/N/C catalysts.

The third heat treatment seemed to deactivate the Fe/N/C catalysts somewhat, seeing as their onset potentials were between two and three standard deviations below the mean of the main section samples. Perhaps different carbon morphologies were produced with greater interfacial resistance than those produced with the  $\text{N}_2\text{-CH}_3\text{CN-NH}_3$  sample. The difference in activity between the third heat treatment samples might be due to deposition over active sites formed by the ammonia etching and/or surface modifications caused by the heat treatments.

## Appendix A

### Experimental Design

The experimental design chosen for this thesis was D-optimal. This was selected because D-optimal designs provide more precise estimates of model parameters.<sup>82</sup> This design was modified based on the inability to use four of the catalysts. The original design is presented in Table 8 and the modified design is presented in Table 9.

**Table 8.** Original D-Optimal Experimental Design.

Sample	Carbon Support	Acetate: Nitrate Precursors	Inert Gas	Reactive Gas	Reactive Gas Pyrolysis Duration (min)
1	KB	1:0	N <sub>2</sub>	CH <sub>3</sub> CN	5
2	BP	1:0	Ar	CH <sub>3</sub> CN	40
3	KB	1:1	N <sub>2</sub>	NH <sub>3</sub>	40
4	KB	1:1	Ar	NH <sub>3</sub>	5
5	BP	1:0	Ar	NH <sub>3</sub>	5
6	BP	1:0	N <sub>2</sub>	NH <sub>3</sub>	40
7	BP	0:1	Ar	CH <sub>3</sub> CN	5
8	KB	1:0	N <sub>2</sub>	CH <sub>3</sub> CN	20
9	BP	1:0	N <sub>2</sub>	NH <sub>3</sub>	5
10	BP	1:1	Ar	CH <sub>3</sub> CN	20
11	KB	0:1	N <sub>2</sub>	NH <sub>3</sub>	5
12	KB	0:1	N <sub>2</sub>	CH <sub>3</sub> CN	40
13	BP	1:1	N <sub>2</sub>	NH <sub>3</sub>	20
14	BP	1:1	N <sub>2</sub>	CH <sub>3</sub> CN	5
15	BP	0:1	Ar	NH <sub>3</sub>	40
16	KB	1:0	Ar	CH <sub>3</sub> CN	5
17	KB	0:1	Ar	NH <sub>3</sub>	20
18	KB	1:0	Ar	NH <sub>3</sub>	20
19	BP	0:1	N <sub>2</sub>	CH <sub>3</sub> CN	20
20	KB	1:1	Ar	CH <sub>3</sub> CN	40

**Table 9.** Modified Experimental Design.

Sample	Carbon Support	Acetate: Nitrate Precursors	Inert Gas	Reactive Gas	Reactive Pyrolysis Duration (min)
1	BP	1:0	Ar	CH <sub>3</sub> CN	40
2	KB	1:1	N <sub>2</sub>	NH <sub>3</sub>	40
3	KB	1:1	Ar	NH <sub>3</sub>	5
4	BP	1:0	Ar	NH <sub>3</sub>	5
5	BP	1:0	N <sub>2</sub>	NH <sub>3</sub>	40
6	BP	0:1	Ar	CH <sub>3</sub> CN	5
7	KB	1:0	N <sub>2</sub>	CH <sub>3</sub> CN	20
8	BP	1:0	N <sub>2</sub>	NH <sub>3</sub>	5
9	BP	1:1	Ar	CH <sub>3</sub> CN	20
10	KB	0:1	N <sub>2</sub>	NH <sub>3</sub>	5
11	BP	1:1	N <sub>2</sub>	NH <sub>3</sub>	20
12	BP	0:1	Ar	NH <sub>3</sub>	40
13	KB	1:0	Ar	CH <sub>3</sub> CN	5
14	KB	1:0	Ar	NH <sub>3</sub>	20
15	BP	0:1	N <sub>2</sub>	CH <sub>3</sub> CN	20
16	KB	1:1	Ar	CH <sub>3</sub> CN	40

## Model and Power Analysis

The first model generated was tested for each response – onset potential, peak voltage, and current density – and it was

$$y = \mu + CB_i + FeP_j + IG_k + PG_l + PD_m + \varepsilon$$

where  $\mu$  = mean and  $\varepsilon$  = random error. Table 10 describes the factors and responses included in the model.

**Table 10.** Factors and Responses included in Main Section Statistical Model.

y (response)	CB <sub>i</sub>	FeP <sub>j</sub>	IG <sub>k</sub>	PG <sub>l</sub>	PD <sub>m</sub> (min)
Onset potential	Ketjen Black (KB)	1:0	Argon	Ammonia	5
V <sub>-0.1</sub>	Black Pearls (BP)	1:1	Nitrogen	Acetonitrile	20
V <sub>pr</sub>		0:1			40

The statistical analysis proceeded by first checking the significance of the model. If the model was not significant, then the significance of the parameter estimates was analyzed and a factor was removed from the model based on how close the p-value was to one. The model was then retested. This procedure was used for all of the responses using various combinations of the factors. The lists of the combinations used are presented in Tables 11 – 13.

**Table 11.** List of Models Tested and Corresponding p-values for the Response of Onset Potential.

Model Factors	p-value (Prob>F)	Rsquare	Max Rsquare
CB, FeP, IG, PG, PD	0.9878	0.1206	
CB, FeP, PG, PD	0.9693	0.1162	0.9620
CB, FeP, PG	0.8818	0.0938	0.4306
CB, FeP, PD	0.9857	0.0551	0.6698
CB, PG, PD	0.9393	0.0642	0.6729
CB, FeP, IG, PG	0.9518	0.0939	0.8614
CB, FeP	0.8973	0.0466	0.0870
CB	0.7735	0.0061	
FeP, PG, PD	0.9438		
FeP, PG, PD, FeP*PG	0.9714		
FeP, PG, PD, FeP*PD	0.3800		
FeP, PD	0.9725		
FeP, PD, FeP*PD	0.4953		
FeP, PG, PD, PG*PD	0.9881		
PG, PD	0.8623		
PG, PD, PG*PD	0.9722		
FeP	0.7925	0.0351	
CB, FeP, PG, PD, FeP*PD	0.2538		
CB, FeP, IG, PG, PD, FeP*PD	0.0533		
PG	0.4297	0.0451	
PD	0.9674	0.0050	

**Table 12.** List of Models Tested and Corresponding p-values for the Response of  $V_{-0.1}$  (Current Density).

Model Factors	p-value (Prob>F)	Rsquare	Max Rsquare
CB, FeP, IG, PG, PD	0.9395	0.2028	
CB, FeP, IG, PG	0.8201	0.1759	0.8534
FeP, IG, PG	0.6994	0.1680	0.7565
FeP, PG	0.5380	0.1995	
FeP	0.4914	0.1596	0.2748
CB	0.6905	0.0116	
CB, FeP	0.6887		
CB, FeP, CB*FeP	0.8752		
CB, FeP, PG	0.7009		
CB, FeP, PG, PG*CB	0.1998		
CB, FeP, PG, PG*FeP	0.7462		
CB, FeP, PD	0.8814		
CB, FeP, PD, CB*PD	0.7689		
CB, FeP, PD, PG	0.8984		
CB, FeP, PD, PG, PD*PG	0.9698		
CB, FeP, PD, PG, CB*PG	0.4216		
CB, FeP, PD, PG, CB*PG, FeP*PG	0.6246		
CB, PG, CB*PG	0.3803		
IG	0.5704	0.0235	
IG, CB	0.7893		
IG, CB, PG	0.8052		
IG, CB, PG, FeP	0.8201		
IG, CB, PG, FeP, CB*PG	0.3271		
IG, CB, PG, CB*PG	0.5586		

**Table 13.** List of Models Tested and Corresponding p-values for the Response of  $V_{pr}$  (Peak Voltage).

Model Factors	p-value (Prob>F)	Rsquare	Max Rsquare
CB, FeP, IG, PG, PD	0.3780	0.5221	
CB, FeP, IG, PG	0.1633	0.5006	0.9935
CB, IG, PG	0.0413*	0.4840	0.8035
CB, FeP, PG	0.0853		
CB, FeP, PG, PG*CB	0.0249*		
CB, PG	0.0141*	0.4806	0.6056
CB, PG, CB*PG	0.0090*		
CB, PG, CB*PG, PD	0.0559		
CB, FeP, PG, CB*PG, FeP*PG	0.1133		

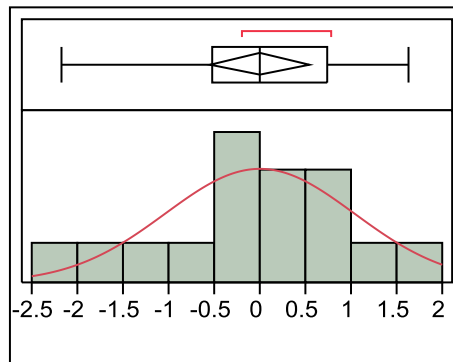
Note that an asterisk indicates a significant model

After obtaining models that were significant, the power of the factors was determined. One limitation of the JMP® software is that it is unable to perform power analysis of categorical interaction terms (*e.g.* PG\*CB); thus, the power of models that

contain interaction terms could not be fully determined. As a result, only the power analysis of the model

$$y = \mu + CB_i + PG_l + \varepsilon$$

where y is the peak voltage, will be reported. Prior to power analysis, it was confirmed that the studentized residuals were normally distributed. This analysis is presented below.



**Figure 14.** Normal Distribution of Studentized Residuals of Model for Peak Voltage.

Note: The mean and standard deviation are listed below.

**Table 14.** Quantiles of Studentized Residuals of Model for Peak Voltage.

100.0%	maximum	1.62231
99.5%		1.62231
97.5%		1.62231
90.0%		1.43641
75.0%	quartile	0.73118
50.0%	median	0.00944
25.0%	quartile	-0.5315
10.0%		-1.7578
2.5%		-2.1741
0.5%		-2.1741
0.0%	minimum	-2.1741



**Table 15.** Moments of Studentized Residuals of Model for Peak Voltage.

Mean	0.0007485
Std Dev	1.0364542
Std Err Mean	0.2591136
Upper 95% Mean	0.5530359
Lower 95% Mean	-0.551539
N	16

**Table 16.** Fitted Normal Parameter Estimates of Studentized Residuals of Model for Peak Voltage.

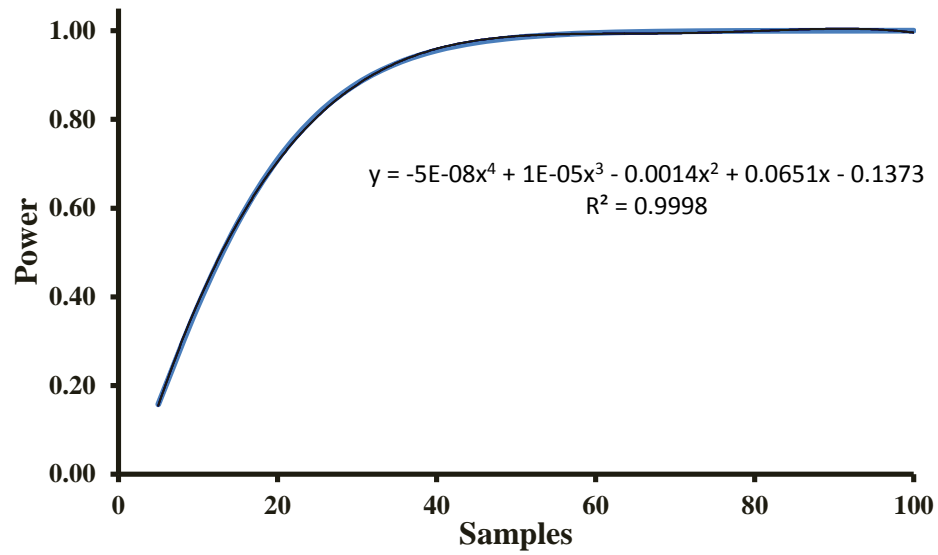
Type	Parameter	Estimate	Lower 95%	Upper 95%
Location	$\mu$	0.0007485	-0.551539	0.5530359
Dispersion	$\sigma$	1.0364542	0.7656338	1.6041111

**Table 17.** Goodness-of-Fit Test (Shapiro-Wilk W Test) for Studentized Residuals of Model for Peak Voltage.

W	Prob<W
0.959921	0.6603

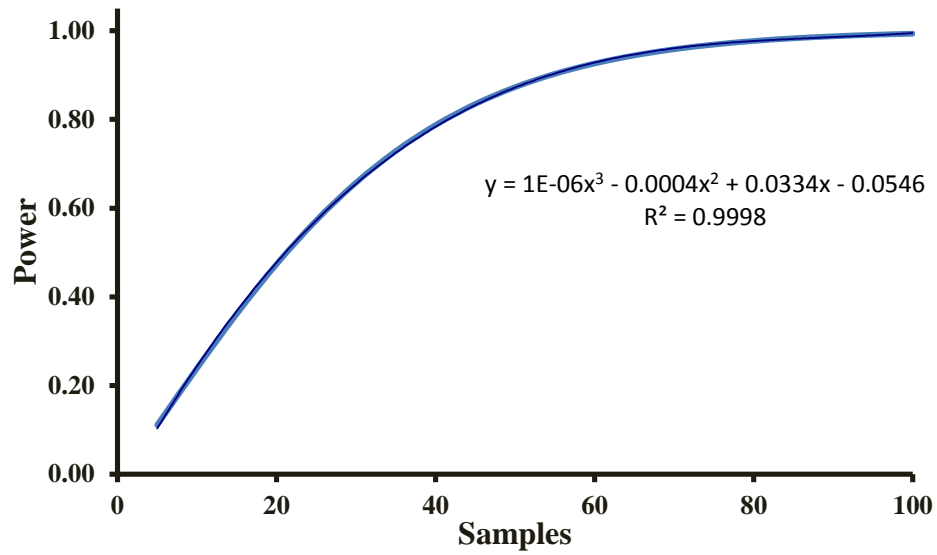
Note:  $H_0$  = The data is from the Normal distribution. Small p-values reject  $H_0$ .

Since the studentized residuals were normally distributed, the power analysis could be performed without needing to exclude any points. The results of this analysis are presented below.



**Figure 15.** Power of Pyrolysis Gas Factor in the Model for Peak Voltage.

The power of the pyrolysis gas factor was estimated assuming  $\alpha = 0.05$ , the standard error of the residual error ( $\sigma$ ) = 33.74, and the raw effect size ( $\delta$ ) = 20 mV. Using these assumptions, an LSN of 14 was obtained. When combined with a well-fitting polynomial trendline, a power of 0.58 was obtained.



**Figure 16.** Power of Carbon Support Factor in the Model for Peak Voltage.

The power of the carbon support factor was estimated assuming  $\alpha = 0.05$ , the standard error of the residual error ( $\sigma$ ) = 36.05, and the raw effect size ( $\delta$ ) = 16 mV. Using these assumptions, an LSN of 22 was obtained. When combined with a well-fitting polynomial trendline, a power of 0.38 was obtained.

The power of a multifactor model is equal to the product of the powers of the individual factors; thus, the model power equals

$$1 - \beta = 0.58 * 0.38 = 0.22$$

The predictive qualities of this model are presented below.

**Table 18.** Summary of Fit for Peak Voltage Model.

RSquare	0.480697
RSquare Adj	0.400804
Root Mean Square Error	29.88647
Mean of Response	677
Observations (or Sum Wgts)	16

**Table 19.** Analysis of Variance for Peak Voltage Model.

Source	DF	Sum of Squares	Mean Square	F Ratio
Model	2	10748.383	5374.19	6.0168
Error	13	11611.617	893.20	<b>Prob &gt; F</b>
C. Total	15	22360.000		0.0141*

**Table 20.** Lack of Fit Results of Peak Voltage Model.

Source	DF	Sum of Squares	Mean Square	F Ratio
Lack Of Fit	1	2792.400	2792.40	3.7995
Pure Error	12	8819.217	734.93	<b>Prob &gt; F</b>
Total Error	13	11611.617		0.0750
				<b>Max RSq</b>
				0.6056

**Table 21.** Parameter Estimates for Peak Voltage Model.

Term		Estimate	Std Error	t Ratio	Prob> t
Intercept		672.37097	7.591172	88.57	<.0001*
CB[KB]		-16.57863	7.531632	-2.20	0.0464*
PG[CH3CN]		-20.45363	7.531632	-2.72	0.0177*

As the “Lack of Fit” analysis and Rsquare value demonstrate, the model does not fit the data well even though it is significant. This could be related to the low power obtained for the model, the small number of factors used, or the actual effect size of the peak voltage.

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